Blockchain in IoT: Current Trends, Challenges and Future Roadmap

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Abstract The Internet of Things (IoT) is one of the most promising technologies in the era of information technology. IoT enables ubiquitous data collections and network communications to bring significant and indispensable convenience and intelligence both to daily life and industrial operations. However, IoT is still confronting a number of challenges and manifesting a series of issues that need to be addressed urgently. Counterfeit hardware, software faults, security issues during communication, system management difficulties, and data privacy issues are significant issues for current IoT infrastructure. Meanwhile, blockchain, as an emerging information technology, has attracted huge public interest and has shown significant promise because of its decentralization, transparency, and security. The features of blockchain seem to be an ideal match for IoT, and by applying blockchain to an IoT environment, some of the aforementioned weaknesses can be addressed. This paper's purpose is to introduce the use of blockchain in IoT applications. We present various challenges facing an IoT system and summarize the benefits of adopting blockchain into IoT infrastructure. We primarily focus on illustrating the blockchain applications in IoT with refined capabilities and enhanced security. To shed light on blockchain in IoT research, we also discuss limitations and future directions.

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1 Introduction

Because of the rapid development of the Internet of Things (IoT), the number of devices connected to the Internet has grown at an unprecedented rate. The concept of IoT is to allow various types of devices to collect and exchange data through the network, which includes not only computers and smart phones but also cars, dishwashers, televisions, and other common household appliances connected to the Internet. A recent report from Gartner indicates that 8.4 billion connected things were in use in 2017, and that the number will reach 20.4 billion by 2020 [80]. Besides the massive number of devices that can be deployed, IoT also stands to open huge business prospects for various organizations, where over 800 billion dollars revenue would be generated by 2020 [17]. However, the large scale and heterogeneity of IoT are increasing the difficulties in design and management [210].

To address the challenges and limitations of implementing IoT infrastructure, an holistic technical evolution and innovation is necessary. Even though new standards, lightweight protocols, and novel frameworks have been proposed, some of the challenges of IoT remain unsolved. Service providers, device manufactures, customers, and researchers are seeking solutions to emerging problems in IoT, particularly those associated with addressing security at acceptable performance. Since the emergence of blockchain technology, certain classes of problems associated with IoT may be settled through the use of a reliable, distributed ledger technology. In the past three years, blockchain has attracted explosive public interest because of its distributed, decentralized, and transparent nature. We assert here that blockchain can

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be used to help IoT solve and bypass many of its perceived and identified limitations.

In this paper, we present an overview of IoT challenges in system design, data management, device management, service management, and security. Then, we demonstrate how blockchain can potentially help to address these limitations. To give an overview of the background, we perform a comprehensive review of blockchain technology. In addition, we illustrate blockchain usage in IoT within agriculture, energy, healthcare, industrial, smart city, smart home, and transportation domains. Since blockchain appears to be suitable for to improve aspects of security for IoT, we analyze and discuss the use of blockchain for IoT access control, data assurance, counter tampering, key management, and trust. This paper also describes and summarizes the challenges and limitations of using blockchain in IoT. We discuss the form, fit, and function of blockchain for IoT, such as: practical implementation cost, throughput and latency problems, on-chain security concerns, and maintenance and regulation issues. Furthermore, we investigate research trends and future roadmaps with regard to blockchain optimization for IoT applications.

1.1 IoT Challenges and Limitations

Although IoT architecture, protocols, and middleware enable different types of devices to connect and communicate, its heterogeneity and scalability cause certain issues. For instance, some resource-constrained devices cannot afford the overhead of typical registration, communication, and authentication protocols. To interoperate with these devices, resource-rich devices need to downgrade their protocols to a lightweight version so that all the devices can communicate, and operate in a new, uniform manner. However, the security of such lightweight communication protocols and schemes face challenges [18, 209]. Therefore, when a large number of devices carry and transmit personal and sensitive data with weak security guarantees, counterfeit hardware, software malfunction, communication privacy, system management, and data storage create a new series of challenges for an IoT system.

As shown in Figure 1, the challenges to implement IoT infrastructure can broadly be classified into five categories: system design, data management, device management, service management, and security [18, 20, 29, 50, 87, 209].

1. System Design: From a single device perspective, the underlying embedded system needs to support efficient, reliable, and robust data collection and data transmission. Particularly for resource-constrained devices, a streamlined operating system (OS) and customized firmware are almost always needed to ensure these tiny devices can operate properly [31, 68, 121]. For the overall IoT

- system, the device needs to satisfy the requirements of availability, scalability, flexibility and cost-efficiency. In addition, for various application domains, multiple factors need to be considered, including quality of service, latency, redundancy, mobility, and security. Generally, most IoT systems are designed on centralized architectures such that no matter how the underlying Machine to Machine (M2M) communications [198] and middleware communications (Gateway to Gateway) are handled, the system is connected to and managed by central (cloud) servers. Though the current paradigm works properly, the foreseeable growth of big data and IoT triggers the need for decentralized solutions.
- 2. Data Management: Whether text, audio, video, discrete, and/or stream, IoT data is generated by a variety of devices and is likely to have inconsistent formats and semantics. Managing the large volume of heterogeneous data introduces a series of technical challenges. Data generated by digital sensors, automobiles, and electrical meters require processing (pruning, compression, labeling) before it can be used and stored, which is a nontrivial cost of processing power. After the data is collected and processed, another hard requirement is to provide data storage for the massive amount of data. Actually, few organizations and enterprises are able to house all the IoT data collected from their networks [117]. Centralized data storage requires and relies on bandwidth and availability; migrating to distributed and decentralized storage may be a better option. To extract valuable information from stored data, appropriate data mining tools that are able to couple with big data are needed; however, data mining techniques against image and video data are another problem [117].
- 3. Device Management: Managing a massive number of devices presents a further challenge. Besides the person power needed for the devices' deployment, the naming and addressing scheme of devices is also a concern. Millions of devices consume a large address space in the IPv4 context, and additional hardware/software support may be needed to enable IPv6 (e.g., ipv6EtherShield for Arduino platform [106]). Alternatively, some devices are only networked with local-area, low-power networks such as Zigbee and Bluetooth [23, 41]; still others may use even lower power, lower security networking protocols. Once device deployment is finished, another issue arises: how to keep the security credentials, firmware, and software on the devices up to date. Generally, a traceable, auditable, manageable, and reliable maintenance mechanism is critical for the infrastructure's operations; however, traditional methods cannot fulfill the requirements. Although some Over-the-Air (OTA) maintenance approa-

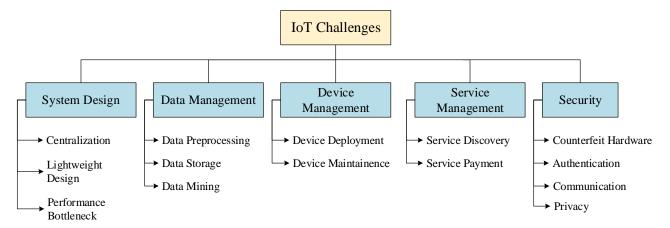


Fig. 1 Taxonomy of IoT Challenges [18, 20, 29, 50, 87, 209]

ches are available [48,111], their reliability and efficiency are still arguably low [34].

- 4. Service Management: An IoT service provider may require careful consideration and strict configurations before granting customers direct access to such resources. This concern is based on infrastructure security. On the contrary, if all the available services are fully abstracted, exposed, and managed by the service provider, then customers need to query the service provider for any services of interest and are not able to discover the detail of the data source. The usage of services is based on the trust between the infrastructure's owner and customers. Therefore, a method to provide transparent and reliable service discovery and usage is required. Beyond that, the purchase of services also needs to be resolved. Instead of manually buying certain amounts of data or resources, a thing-to-thing data purchase would be more economical and efficient and automatically enable the devices to compensate and/or reimburse each other for services without any human interaction. Traditional payment methods are insufficient to handle these massive numbers of micro-transactions because of the limited capacity and high transaction costs [134].
- 5. Security: Security is always a major concern of modern network systems, especially for an IoT system, because of the manifold security issues observed on both the hardware and software levels. As mentioned above, tiny and inexpensive resource-constrained devices occupy a large portion of the IoT network. Unfortunately, the characteristics of low-power, small-memory, limited-processing capability, and low-cost devices also imply the strong potential for vulnerabilities. For instance, power constraints also limit encryption functionality, which leads to poorly encrypted communication or no encryption at all [190]. (Furthermore, encryption replaces the problem of data privacy with the complexity of key management for net added security.) The hardware deficits not only confine device capabilities but also incur potential risks:

- Counterfeit Hardware:

The risk of infiltrating counterfeit devices in IoT infrastructure has been observed in recent years. A report from Borderhawk mentioned that a steady stream unusual network traffic is originated from a counterfeit IoT remote power manager [191]. It was estimated that the counterfeit devices have been installed by thousands of energy companies. In addition, the recent hardware hack reported by Bloomberg shows how the counterfeit hardware can create a stealth doorway into the network and compromise the security of an information system [159]. As most IoT devices are small, simple and expensive to manufacture, it can be easy for an adversary to counterfeit a popular piece of hardware. Since most of the devices are manufactured in limited trust environments without sufficient regulations (and then are distributed through supply chains without reliable supervising), counterfeit hardware is on the rise. Though some cloud manufacturing approaches have been proposed to provide on-demand, manageability, traceability support [182, 183, 200], the manufacturing process still needs the participation of a centralized platform. The reliability of supervision can provide the trustworthiness of devices, and the blockchain can be the perfect candidate for providing that support.

- Device Authentication: Limited processing capability and insufficient memory space also cause problems in device authentication. Since encryption and digital signature are expensive for resource-constrained devices, lightweight yet reliable authentication solutions are needed. Recently, much work related to Radio Frequency Identification (RFID) [75] and Physically Unclonable Functions (PUF) [91,177] indicate the feasibility of energy-efficient, low-cost, and secure authentication for an IoT scheme. However, the deployment and management of such IDs face challenges as well [109]. Generally, it is inconvenient for

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both customers and manufacturers to track or maintain the IDs of devices. During system deployment, an administrator needs to solve the issue of how to store and protect the identities. Centralized identity management may confront the single point failure, which would cause the failed authentication or identity leak.

- Device Communication: To achieve the best-quality transmission, such as Transmission Control Protocol (TCP) [104], it is necessary to provide high device resources. Handshakes and re-transmissions impose heavy loads for devices with limited processing resources and cause bandwidth congestion. In the past few years, several new protocols and standards that aim to offer lightweight, efficient, and secure communication for IoT have been proposed [20]. For example, CoAP is already widely used and tested by industry and academic researchers. However, the security of such protocols is still not guaranteed [157].
- Data Privacy: Data privacy and user preference need immediate attention, as personal and sensitive data spread in the IoT networks [18, 209]. First, data access needs a reliable and flexible control that ensures no one can touch or leak others' personal data. Second, user preferences, such as device ownerships, device configurations, and specific policies need to be managed in a secure manner. The customer should be able to easily and smoothly obtain the data, change the preferences, or stop the services on his/her demand, all in such a way that no one could eavesdrop on, delay, or interrupt this procedure.

Despite the fact that IoT possesses a variety of attractive capabilities and has bright prospects, its limitations and challenges cannot be ignored. The aforementioned context only presents the issues briefly, and there are many solutions and methods proposed elsewhere to deal with these problems without using blockchain. However, the detailed descriptions of these solutions are out of the scope of this paper. This paper focuses on how to use blockchain technology to address some of the limitations of IoT. Note that even if the blockchain is integrated with IoT as discussed here, there is no perfect solution at this stage and not all the aforementioned issues in IoT can be solved using blockchain.

1.2 Blockchain Technology

The concept of blockchain originated from the cryptocurrency system Bitcoin, which was introduced by Satoshi Nakamoto in 2008 [145]. The fundamental features include hashbased block structure, a consensus algorithm (e.g., Proof-of-Work (PoW), Proof-of-Stake (PoS) [144]), and decentralized architecture. Advanced functionality such as the smart

contract is supported by certain blockchains [26, 196]. Recently, blockchain as a distributed ledger system that can provide global data integrity and transparency is gaining increasing attention since data is the key factor of all modern systems. Both industrial and academic researchers are working toward the appropriate use of blockchain technology. Generally, blockchain can be used to enhance service transparency and availability. For instance, applications of blockchain-based identity providers, voting systems, financial services, and supply chain management have already emerged [149].

Blockchain applied IoT infrastructure (BIoT) is one of the other feasible uses of blockchain, which also has tremendous potential. Some companies and organizations have already started to investigate BIoT. For instance, IBM has integrated the Watson IoT Platform with blockchain, which ensures the transparency of provenance, operational, and maintenance records [103]. Airbnb has also heavily invested in blockchain research for addressing different IoT implementations, (e.g., the door to a rented home would be locked/unlocked when a user completed the payment to the owner over a blockchain [137]). The reason to consider adopting blockchain into IoT is that blockchain provides effective ways to address the constraints of IoT. A discussion of how blockchain can help IoT is depicted in the Table-1. Generally, blockchain offers reliability, scalability, and transparency for IoT and enhances the performance and security of the system. Investigating the fusion of blockchain and IoT can lead to a more effective and secure IoT scheme, which matches the expectations of most users and researchers.

1.3 Motivation and Contribution

There is an urgent need to point out all different challenges and provide guidance for future research on the seamless integration of IoT and blockchain. This paper aims to demonstrate the feasibility and current status of BIoT by reviewing related research off the past few years.

There already exists a few work that surveys blockchain into IoT [51,53,74,76,101,110,114]. The main contribution of our work is to provide a comprehensive analysis of blockchain in IoT, which covers not only the concepts, but also all different applications and their security concerns. Compared to the previous works, our contributions are summarized as follows:

- We present a detailed taxonomy of different types of blockchains in this paper. A clear and straight forward overview of blockchain applications in different domains are also described in detail.
- We analyze and introduce up-to-date blockchain-based IoT applications and implementations. We explain and

| IoT Challenges | How Can Blockchain Help |
|--|---|
| System Design: Hierarchy-centralized IoT architecture has scalability, throughput, and security limitations. | Blockchain can help to build up a decentralized IoT system that can overcome some of the constraints. The P2P communication scheme of blockchain is an ideal match for IoT. Efficient, reliable, robust, and scalable IoT system can be operated over the blockchain. |
| Data Management: Need distributed and reliable data storage. | A blockchain system can be used to provide auditable data storage for an IoT environment and also can be used as an additional layer of cloud storage to provide data integrity guarantees. |
| Device Management: Difficulty of large-scale deployment and maintenance. | Blockchain can help to maintain the security credentials, firmware, and applications on the devices in a reliable and efficient manner. |
| Service Management: Inefficient service discovery, indirect device usage, lack of flexibility in payment methods. | Blockchain enables decentralized and automatic service discovery, al- lowing the reliable direct access to the IoT resources where the secu- rity and efficiency can be balanced. Blockchain also supports micro- transactions among IoT devices. |
| Security: Counterfeit problem, lack of communication security, data privacy concerns. | A blockchain system can provide reliable provenance tracking for IoT devices to solve the counterfeit problem. Refined access management, data assurance, and data privacy are also introduced by blockchain-based IoT solutions. |

Table 1 How Blockchain Can Address IoT Challenges

illustrate how blockchain could enhance different IoT applications.

- We systematically discuss the use of blockchain to enhance IoT security. Methods of using blockchain to enhance security (both hardware and software) in IoT scenarios are presented as well.
- The challenges and limitations of using blockchain in IoT applications are analyzed. The potential solutions and related works that were proposed to overcome the limitations are summarized as well.
- The blockchain in IoT research trend is analyzed in detail and the future roadmap is also presented.

The remainder of this paper is organized as follows. We present a systematic overview of blockchain in Section 2. We investigate the blockchain applications in IoT in Section 3. We introduce the use of blockchain for IoT security in Section 4. We discuss challenges and limitations in Section 5. We also summarize and elicit the research roadmap

of blockchain for IoT in Section 6. Finally, we conclude the paper in Section 7.

2 Blockchain

Blockchain is a distributed ledger system running over a peer-to-peer (P2P) network [164]. It aims to provide reliable and traceable data, as well as value exchange among untrusted entities without involving a centralized third party The concept of blockchain was first introduced by Satoshi Nakamoto in the groundbreaking Bitcoin paper, which was originally proposed to solve the double-spending problem in digital currency systems [65]. The success of Bitcoin triggered rapid development and public interest in blockchain technology. Particularly in the past two years, the explosive appreciation of cryptocurrency has made blockchain a new technical "hot topic." Note that the cryptocurrency system is not fully equivalent to blockchain, as a cryptocurrency system always consists of blockchain, protocol, and currency [179]. Blockchain is actually a tool to build up the cryptocurrency system. Although blockchain is designed for cryptocurrency systems and transaction recording, blockchain now can be applied into various fields as it evolves. To introduce the functionality of blockchain and how to apply blockchain into IoT, the following subsections describe its fundamental characteristics.

2.1 Basic Concepts

The basic idea of blockchain is to collaborate on recording information, in such a way that the participants in the network do not trust each other [145]. A public, auditable ledger helps provide verification and accountability for data [147]. Whenever an entity initiates a transaction, a group of "volunteer recorders" start to write down this new transaction in their own local ledger. And after a period of time, a selected ledger from these recorders, which contains a set of transactions, will be verified and attached to the public ledger [213]. The recorders are known as miners in the blockchain systems. The local ledgers owned by the recorders are known as data blocks. The algorithm used to select a block to attach to the main public ledger is called a consensus algorithm, and the public ledger formed by these selected data blocks is called the blockchain [213].

This whole procedure is protected by digital signatures; that is, each transaction is digitally signed using the private key of the sender [145]. As a result, the validity and integrity of a single transaction are guaranteed. The integrity of the entire blockchain is ensured with hash computations. To encourage miners, coins are assigned to them as a reward once they successfully append a block to the ledger [71].

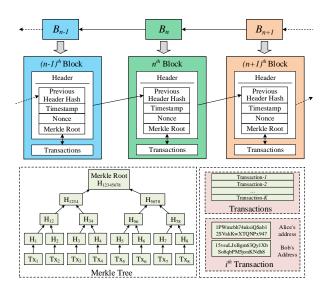


Fig. 2 Blockchain Architecture (Based on Bitcoin)

2.2 Blockchain Transaction

The transaction is the minimum, fundamental data unit in the blockchain, which represents the action triggered by a participant [213]. To initiate a transaction, the participant needs to associate the transaction with the cryptography credentials. Each participant in the blockchain network holds a pair of public and private keys. By applying a series of hashing and encoding functions on the public key, a short and unique address is generated as the public address of the participant (as depicted in Figure 2). Normally, the transaction contains the address of the sender and receiver, and it is signed by the sender's private key. Once a participant initiates a transaction, it needs to broadcast the transaction to its connected peers, and the peers that receive this transaction will continuously relay the transaction to subsequent peers (more details of the block/transaction propagation can be found in [123]. Each transaction and the block that contains all transactions are verified by the miners, and a valid transaction is not approved and executed until specific requirements are satisfied (such as a certain amount of proof of work in Bitcoin, the transaction is approved until 6 blocks are appended which is a countermeasure to the double spending) [39].

2.3 Blockchain Structure

In a typical blockchain system such as Bitcoin or Ethereum, miners add valid transactions to a block, and a Merkle Root [138] is created for all these transactions as a digest or fingerprint [145]. As shown in the Figure 2, a block header contains the hash of the previous block header, timestamp, a nonce, and the Merkle root of the transactions in the current block. All the blocks are connected in the form of a

linked-list, which is a type of data structure in which each data element contains a link to its successor or predecessor. As the whole network works on the same single chain, for a certain period of time, only a limited number of transactions can be validated by the newly generated block [71]. Thus, the block generation interval and the block size determine the transaction verification speed. For example, Bitcoin can append a new block with block size 1MB every 10 minutes, which yields 3–7 transactions verified per second [71,193].

Instead of packing a group of transactions into a block and forming a chain in a linked-list, another blockchain structure has been proposed that is based on the concept of Directed Acylic Graph (DAG). In the model of DAG blockchain, there is no need to encapsulate transactions into a block, and each transaction may represent a data point in the DAG. A notable DAG-based blockchain structure is Tangle, which was designed by IOTA [1]. In Tangle, one needs to verify two previous transactions and link the new transaction with the previous two to append a new transaction. An example of two types of blockchain structure is shown in Figure 3. In the linked-list blockchain, a certain number of transactions can be appended to the blockchain in a time interval. However, in a high transaction rate scenario, not all the transactions can be added, as with the transactions with red Tx tags in the Figure 3-(a). On the other hand, transactions and blocks can be appended to the blockchain in a flexible and efficient manner by using DAG based structure. As shown in Figure 3-(b), the transactions with red Tx tags can also be added to the chain.

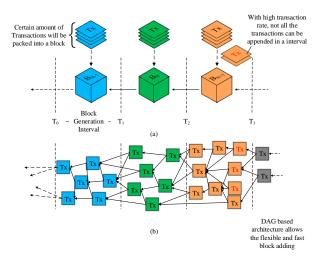


Fig. 3 Blockchain Structures: (a) Linked-list based blockchain [26, 145] (b) DAG-based blockchain [1, 37, 176]

2.4 Consensus Algorithm

Regardless of what structure is used in the blockchain, a consensus algorithm is always needed to ensure fairness and security. The consensus algorithm is a required verification step for adding transaction records to the public ledger. As mentioned above, a new generated block is actually a selected ledger from all the miners; thus, a mechanism is needed to make all the miners reach the consensus about the selection. Note that this selection must not be biased in any sense. In an ideal model, every miner's ledger (in the processing block) should have the same chance to be selected. However, one could run multiple nodes to increase the possibility to be picked in the case of random selection. An attacker that controls a large number of nodes can practically manipulate the selection procedure. To prevent this, several algorithms emerged:

- Proof-of-Work (PoW): In the PoW system, all miners compete to finish a computational resource—intensive task, and the first one solves the task can append the current block to the public ledger. For example, the PoW in the Bitcoin system requires finding a nonce such that the hash of the current block header (including the nonce) is less than a specific value. This method improves security since the consumption of computational power increases the cost of selection participation, and, once the computational puzzle is solved, all the other nodes can verify the answer easily. However, the drawback is the waste of resources: except for the winner of the mining, all the work of other nodes is simply wasted [203]. Note that all nodes in the blockchain system cannot participate in the mining due to excessive computational overhead.
- Proof-of-Stake (PoS): The PoS is an alternative consensus algorithm that requires less computational power than the PoW does. Instead of proving a certain amount of work has been done, miners must prove ownership of a certain amount of stake in the blockchain system. Ownership of the stake creates an implementation challenge, if a node does not own a certain amount of stake and thus it can never be involved in the miner selection process. As a result, the wealthiest nodes can always control the blockchain. To address this issue, several variants of PoS have been proposed. For instance, in the Delegated Proof-of-Stake (DPoS) [40], stakeholders do not verify and append blocks by themselves but select a group of delegates to perform the block validating. Coin age, which was introduced by Peercoin [153], includes stake holding time as an additional measurement. Although PoS is more efficient compared to PoW, it is still not widely deployed: it occupies less than 2% of the market capitalization of existing digital currencies [122].

- Byzantine Fault Tolerance (BFT): The Byzantine Generals Problem [115] describes a conceptual situation that needs to reach a consensus among several generals. Blockchain can be considered a solution to this problem since it provides a consensus among remote and untrusted peers. However, solutions already existed before the blockchain was introduced. In addition, these solutions can be used as the consensus algorithm in blockchain, i.e., in the Practical Byzantine Fault Tolerance (PBFT) [46]. Each new block is selected when it is supported by more than 2/3 of nodes. Note that the reliable consensus can always be reached unless more than 1/3 of the network is compromised by the adversary.

Note that various consensus algorithms exist today, including Tendermint [108], XRP Ledger Consensus used by Ripple [59], SCP used by Stellar [136], Ouroboros from Cardan [58], Algorand proposed by Yossi *et al.* [82], and so on. In this article, we mention the details only for the mainstream algorithms. Interested readers can get detailed information from the aforementioned references.

2.5 Smart Contract

A smart contract is an automated agreement enforced by tamper-proof execution of computer code [52]. In the context of blockchain, smart contracts are scripts stored on the blockchain system that enable users to have general-purpose computations occur on the chain [51]. These scripts can be triggered and executed autonomously when certain conditions are satisfied. For example, a contract can be used to provide automatic currency exchange service that transfers a certain number of coins to some units of specific tokens. Smart contracts can be applied to various fields, including B2B international transfers, central clearing, mortgages, and crowd funding [180]. Note that few blockchains (*e.g.*, Ethereum [26] and HyperLedger [24]) support smart contracts.

2.6 Network Type

Based on how the data is managed and accessed in the blockchain system, we can classify the blockchain into two types: permissionless and permissioned blockchain. In a permissionless blockchain, a participant can join the network without any approval or registration, and all the nodes can initiate or verify transactions. On the other hand, access to the network is permissioned, and the operations needed to perform or verify transactions be also under administrator control in a permissioned blockchain. Examples of both permissionless and permissioned blockchains are depicted in Figure 4.

2.7 Security

A blockchain system is vulnerable to an adversary if he or she controls 51% of the computational resources. This attack is known as a 51% attack, especially applicable to the PoW blockchain. If an adversary possesses more than 51% of the computational power of a blockchain system, he or she can control the blockchain and generate valid blocks faster than the rest of the network. Although it seems impossible to perform the 51% attack on a widely used blockchain like Bitcoin and Ethereum, the attacks have been successfully executed on some other blockchains. Recently, the cryptocurrency Verge [192] suffered several rounds of 51% attacks that caused over \$1.7 million dollars to be stolen [16]. At least \$18 million has been falsified from Bitcoin Gold in another 51% attack [9]. Those lesser-known blockchains do not have sufficient overall computational power, and thus the attacker could easily rent computational resources from the market [13] to launch the 51% attack.

PoS-based blockchain systems seem to perform better against 51% attacks because they rely on the idea that the higher-stake holders have less interest and motivation to attack the chain, since the attack could risk the value of their stake. However, PoS systems confront the problem of *Nothing-At-Stake (NaS)*: to maximize profit, a stakeholder can mine and verify multiple conflicting blocks without risking their stake [122].

3 Blockchain Applications in IoT

To overview the blockchain and blockchain applications, we need to create a taxonomy and a summary. Although various metrics can be used for a taxonomy of blockchains, such as the amount and existence of transaction fee, what state channel is used, and whether a native currency system is enabled, blockchain systems are typically categorized based on either consensus algorithms or network access types [179,184, 201,212] because these two attributes determine the network access and underlying mechanism of the blockchain. Here, as illustrated in Figure 4, we perform a comprehensive and visualized taxonomy of blockchain systems based on these two factors in the inner circular area with a red boundary. We also describe blockchain applications in various fields in the peripheral blocks.

The consensus algorithms can be broadly classified into four types – PoW, PoS, BFT, and others (described in Section 2.4). All these four types are shown in the 2^{nd} ring of Figure 4. The 3^{rd} ring describes the network type of blockchain systems, it could be either persimmisoned or permissonless. Note that, blockchain systems with all these four types of consensus algorithms could be either permissioned or permissionless. For example, Multichain is a PoW-based permissioned blockchain, shown in the 4^{th} ring. On the other

hand, Bitcoin is a PoW-based permissioned blockchain. HyperLedger is a BFT-based permissionless blockchain. The last $(e.g., 5^{th})$ ring consists of application and implementation examples of blockchain in various domains. For example, blockchain can be used to provide farm monitoring in agriculture, drug management in healthcare, asset management in financial services, etc.

From a IoT perspective, blockchain is a promising technology that can offer multidimensional reinforcements for the IoT infrastructure. As mentioned in Section 1.3, blockchain can contribute to the following aspects:

- Service Management: As we know, the native and fundamental component of blockchain is the transaction, and the transaction-based blockchain architecture can help with the IoT service payment, which also enables IoT objects to perform real-time, automatic, and micro-transactions in a M2M manner. The concept and a case study of the blockchain-based IoT trading and business model are illustrated in [134, 207]. Using blockchain not only eliminates the need for human interaction but also decreases the cost of developing a payment model for specific services. Meanwhile, blockchain architecture can help to provide service and name discovery in the IoT system [60]. The proposed blockchains can be abstracted into multiple layers: the service regulators layer (government, organizations), the service providers layer, and the users layer. The regulator layer defines services and, for each service, corresponding service providers act as blockchain peers inside this layer. Similarly, all the devices used for a particular service are registered as blockchain peers in the service provider layer. At the user layer, one could discover, locate, pay for, and access a service without knowing IP or MAC addresses of the related devices. In short, blockchain enables the reliable regulating, payment, and logging for the IoT services.
- Device Management: As the system owner needs to deploy and maintain a large number of objects with appropriate network and software configurations, the management of all these devices in the IoT system is challenging. Samaniego [161] and Sharma et al. [171] introduced the design of combining blockchain and softwaredefined networking (SDN) to address the networking management for all the devices. SDN is considered to be a appropriate technique that effectively improves the efficiency of the networking configurations. However, in a large scale SDN enabled system, a notable problem is the asynchronous status of the flow rule table [171]. By adding a blockchain layer over the SDN, the problem can be solved. As the result, the integrated system can perform direct deployment, configuration, and management of IoT components. It not only simplifies the device management but also enables fog computing and

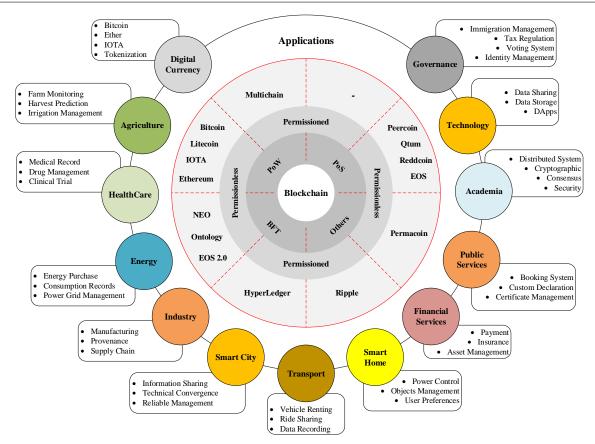


Fig. 4 Blockchain Taxonomy and Blockchain Applications

edge computing to provide additional usable resources for constraint devices. Moreover, new blockchain-based architecture improves the IoT system's performance and capacity, as it is more efficient, secure, and robust [167, 171]. Managing and maintaining the software and firmware for a huge number of devices are also daunting tasks. The problem becomes especially harder when some of the devices are not secured by design. It is essential to fix and patch the vulnerabilities of the firmware and software before adversaries get advantages from these flaws. Boudguiga et al. [42] use blockchain to provide better availability and accountability for IoT software maintenance. As manufacturers have the responsibility to notify of vulnerabilities and provide updates for the flaws, the blockchain can be used as a platform for manufacturers to update the devices reliably. Lim et al. [129] utilized blockchain to provide data integrity during firmware verification of the IoT devices.

- Data Management: To refine the data management of IoT, Shafagh et al. [166] and Liu et al. [133] introduced auditable IoT data storage and sharing systems based on blockchain. In their design, the blockchain works as the middleware between the data storage services and the IoT devices. Blockchain does not directly storing the original data but maintaining the references and access control to the IoT data. Blockchain controls, verifies, records, and protects the storage and usage of the IoT data. The inherent reliability and robustness of blockchain ensures the trust and data security for both users and service providers.

Overall, blockchain is the enabler technique of building a smart management mechanism in IoT systems. Blockchain can enable smart manufacturing, remote maintenance, reliable supply chain management, auditable service, and additional security in IoT infrastructure. In the past few years, many blockchain-based IoT applications emerged in many areas, such as agriculture [44, 120, 130, 131, 188, 189], energy [77–79,86,116,124,126], healthcare [25,69,70,84,93, 128,154,160,205], industry [33,100,142,143,175,187,202], smart cities [38,102,156,158,168–170,173,178], smart homes [19,63,73,96,172], and transportation [10,49,119,204]. The following sections briefly introduces the blockchain applications in IoT.

3.1 Agriculture

Recently, IoT has become a vital component of the modern agricultural system. The power of IoT enables smart sensing of a farm's cultivated area [118, 211]. Real-time monitoring of temperature, humidity, disease, and insect damage

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make a significant contribution to crop growth and harvest prediction. Additionally, a prototype of a blockchain-based agriculture system is proposed in [131], where both the individual farms and the government can get benefits by using the shared information and knowledge. An example is to help the construction and maintenance planning of irrigation canals [131].

The use of blockchain in IoT agriculture applications also helps to provide transparency and traceability for crop and food supply chain [44, 120, 130, 131, 188, 189]. Leng *et al.* [120] proposed to use blockchain integrated system to provide transparent and secure transaction recording for agriculture supply chain. Moreover, the rent-seeking and matching of resources can be self-adaptively completed. In addition, since food safety is always a public issue, blockchain and IoT-based agriculture systems can enable reliable food safety by gathering and exposing information about food production, processing, warehousing, and selling. Tian [188] introduced a method of using RFID and blockchain to enhance food safety. Caro *et al.* [44] implemented a blockchain-based smart agriculture system, which enables the traceability of agriculture products in the supply chain.

3.2 Energy

Smart grid is a revolutionary technique in the electricity power system [92] that enables efficient and automated management via network connections. IoT is the core component and enabler technology of smart grid. By extracting energy data from smart sensors and meters, efficient energy measurement and management can be performed [174]. However, the smart grid has some limitations in complexity and reliability. As power systems complexity increases, managing the system becomes challenging. In addition, the utility companies may face problems with convincing customers of the reliability of meter readings.

Blockchain can be an appropriate tool to solve some of the problems that exist in the smart grid. Researchers have proposed different blockchain-based solutions to address these issues. Laszka et al. [116] propose to make the system more manageable by replacing the original local grid with transactive microgrids. Their proposed framework introduces the design of blockchain-based energy transactions, in which grid nodes can use to perform privacy-preserving energy trading. Gao et al. [78] introduced a smart contractbased smart grid system, which ensures the transparency and provenance of energy consumption. Similar ideas have been proposed in [79,86], which use blockchain to securely monitor and record the use of energy. A consortium blockchain applied energy trading framework is elicited in [124] to secure energy trading and achieve an optimal pricing strategy. Moreover, a blockchain-based data protection framework is

demonstrated in [126], which provides the robust and reliable protection against cyber attacks. Blockchain is also used to provide secure, reliable, and auditable neighbouring energy trading in smart grid [77].

3.3 Healthcare

Blockchain is also considered as a revolutionary technique for healthcare systems [139]. Blockchain-based healthcare implementations fulfill the urgent demands of availability, security, and transparency or privacy, which already play an important role in clinical trials, healthcare data sharing, Electrical Patient Records (EPRs) management, drug tracking, and healthcare device tracking [125]. Meanwhile, smart healthcare, as the most successful and significant application of IoT, would be more preferable and reliable if it could combine with and get benefits from blockchain technology [160].

Data sharing among healthcare organizations can contribute to treatment and medical research; however, the privacy of patient needs to be guaranteed. Esposito et al. [70] demonstrated the need for blockchain in healthcare data sharing and described the design of blockchain-based architecture to ensure privacy and efficiency. Yue et al. [205] illustrated a blockchain scheme that enables the patient to own and control his or her medical data. A prototype is implemented in a smartphone, in which the user can view, determine and limit the sharing of data. In addition, an elaborate discussion and analysis of blockchain-based healthcare data sharing system is performed in [93]. It is also worth mentioning that Liang et al. [128] introduced an integrated blockchain system that connects IoT wearable devices, patients, healthcare providers, and health insurance providers all together to provide reliable data sharing and collaboration. The same concept has been applied in [84, 154], and a block-chain-enabled IoT system is created to monitor the patient health condition and to record the information into blockchain. Another work from Angeletti et al. [25] aims to offer information privacy in clinical trials. Using the blockchain and IoT, individuals can keep their data private until an agreement is reached, and the clinical research institute can ensure that it is acquiring appropriate, useful, and authentic data from individuals.

3.4 Industry

With the emergence of Industry 4.0 [83, 165], IoT has become the backbone technology of cyber-physical systems (CPS), which enable smart sensing and supermatic operations. In addition, smart manufacturing provides remote machine diagnostics and supply chain management provided

by the industrial IoT, which can further be enhanced by block-chain.

In-depth surveys of blockchain in the industrial IoT are performed in [142, 187]. Bahga et al. [33] pointed out that blockchain-based industrial IoT can be applied to on-demand manufacturing, smart diagnostics, supply chain management, product certification, and Machine to Machine (M2M) transactions. They demonstrated a blockchain-based architecture that enables the efficient and secure decentralized IoT service, which allows a user to provision and transact with the machines directly. Moreover, a smart contract-based maintenance and diagnostics prototype is implemented in their work, which can sense the condition of the system and automatically sends notification to a user when a part replacement is needed. Sikorski et al. [175] illustrated a blockchainapplied M2M electricity market scheme for the chemical industry. They also implemented a proof-of-concept system that allows the energy consumer to buy electricity from an energy provider via smart contracts. In addition, a use of blockchain in material industry supply chain management is demonstrated in [143], where blockchain provides tamperproof manufacturing, provenance, and distribution for composite materials. Nevertheless, credit-based trust system can be implemented with blockchain in industrial IoT scenarios [100, 202]. Blockchain could record and manage trust score of the network, while, the service publishing and event logging are taking into account as well.

3.5 Smart City

A smart city is an automatic and holistic management and convergence of technology, institutions, and human factors [146]. In the technology vision, IoT is the fundamental and crucial component of the urban-scale Information Communication Technology (ICT) platform [206]. As the block-chain can provide benefits to the IoT infrastructure in many aspects, it is reasonable and necessary to investigate the usage of blockchain for smart city applications.

Sun *et al.* and Rivera *et al.* provided a detailed survey of how the blockchain can enhance smart cities in both economy and technical perspectives [158, 178]. Ibba *et al.* [102] proposed and demonstrated design of a blockchain-based smart city system to sense and manage data in an effective and secure manner. Biswas *et al.* [38] briefly illustrated the approach of using blockchain to secure smart city applications. Sharma *et al.* [168–170] demonstrated the design of efficient, sustainable, reliable blockchain-based network architecture for smart cities. An information-sharing blockchain over a vehicular network is described in [168], and scalable Li-Fi communication applied network architecture is introduced in [170]. Sharma *et al.* demonstrated the use of blockchain-based architecture to enable the integration of

smart home, smart industry, smart healthcare, smart building, and smart transportation technologies for the smart city scheme in [169]. A similar integration and share of economy information via blockchain is also demonstrated in [156]. Moreover, Shen *et al.* [173] propose to combine machine learning technique with blockchain to provide privacy-preserving data processing in smart city applications.

3.6 Smart Home

IoT applications are beginning to direct modern life toward the fusion of convenience and intelligence, as smart wearables and network-enabled home appliances raise the quality of our daily life to a new level. As in the smart city sector, smart home applications can benefit by leveraging the features of blockchain.

Fernndez et al. [73] proposed a design of a ZigBee-based smart power outlet system for smart homes. Applying block-chain to this system allows remote control and automatic monitoring of power use. Aggarwal et al. [19] introduced the use of blockchain to provide and manage energy trading between smart grid and smart home systems. Another interesting application of using blockchain to build up a smart door lock system is demonstrated in [96], where the blockchain is used for authentication, recording, and payment. Dorri et al. [63] presented a case study of an optimized blockchain system to ensure the security and privacy of smart home applications. A consortium blockchain-based system is implemented to ensure the data privacy of smart home [172], where an additive homomorphic encryption is applied to encrypt the IoT data.

3.7 Transportation

The concepts and examples of using blockchain to strengthen the vehicular network are briefly mentioned in the Section 3.5. There is no doubt that blockchain can be applied to build or reinforce an Intelligent Transportation System (ITS). Several solutions and designs have emerged recently in this domain. For instance, IBM introduced a blockchain-based freight transportation solution, which can reduce or eliminate fraud or errors and also improve efficiency and security [10]. Instead of focusing on the supply chain or logistics, some researchers aim to utilize blockchain in smart travelling [49, 204]. A blockchain-involved transportation system allows the user to securely and efficiently rent or share a vehicle. In addition, payment to the services and the reputation management of the services can be achieved with smart contracts.

Lei *et al.* [119] proposed a method of using blockchain to provide key management to secure the ITS. In a traditional design of ITS, vehicles periodically transmit safety messages during the travel, and the system collects data via

infrastructures built along the roads at specific intervals. For a particular region, the credentials of the vehicle and infrastructures are managed by a central authority. However, whenever the vehicle travels into a new region, the system needs to perform re-keying and re-establishment procedures. In their proposed blockchain-applied architecture, the key transfer time can be shortened and the security of the procedure can be guaranteed.

4 Blockchain for IoT Security

Blockchain is an ideal option to provide decentralized security. The characteristics of high availability, tamper resistance, and transparency can fulfill the security requirements for IoT infrastructure. In this section, we present the use of blockchain for IoT security. In Figure 5, we briefly describe the following measures for addressing security concerns: access control, data assurance, hardware counterfeit and tampering, key management, and trust.

4.1 Access Control

Access management in an IoT system is a challenging problem. How the device and data are being accessed directly determine the security of the system; however, the traditional centralized access control systems cannot fulfill the all the requirements for an IoT system. Some of the weaknesses of the centralized access control systems are summarized in [151] as follows:

- 1. It is hard to achieve end-to-end security.
- Centralization creates a single point of failure on whose availability and reliability the security of the entire system relies.
- As the access control is managed by a remote/local central entity, the user cannot be involved in the control of his or her own data.
- 4. Centralized service providers can make illegitimate use of data (*e.g.*, Prism Program [14]).
- 5. Running a centralized access control system for a large number of devices is expensive.
- 6. For some IoT scenarios that require device mobility or collaborative management, a centralized access control system is not well fitted.

These limitations lead to the proposal of using blockchain to provide an available and reliable access control mechanism.

A blockchain-based access control system has better support of mobility, accessibility, scalability, and transparency. Ouaddah *et al.* [150] briefly demonstrate an access control framework named FairAccess, in which the blockchain is used to store, manage, and enforce the access policies. A simple case study is implemented on the Raspberry Pi, and

the framework is able to securely manage the access of a camera. However, the limitation of FairAccess is that it requires the tokens as the cost and fee for creating and verifying the policies. A similar framework was introduced in [67], where a framework with no tokens and fewer transactions are involved. Ding *et al.* [61] propose to use blockchain as an attribute authority and key generation center for IoT infrastructure. The proposed access control management framework is decentralized and scalable, and further increases the system robustness.

Novo [148] implements a prototype system based on CoAP to provide large-scale access management in the IoT system. The proposed framework consists of three parts: IoT network, management hub, and blockchain network. All data access inside the IoT network is recorded, verified, and managed by the blockchain. Since the edge devices or sensors may not afford the overhead of blockchain operations, the management hub works as the agent (miner) of the blockchain network. In addition, a design and evaluation of a blockchain-based access control system for IoT is illustrated in [199]. It shows that the system performs with acceptable processing delay and latency.

Preserving privacy for the IoT system is another focus of access control. Ensuring availability and transparency of data access is important, but it is more important to prevent the reading or leaking of others' data and configurations. A general platform based on blockchain, IPFS [22], is designed to provide privacy for IoT data. By utilizing a private sidechain, all the data operations are logged and validated. In the work of Cha *et al.* [47], IoT service providers can obtain user consent on privacy policies without modifying legacy IoT devices by using blockchain and smart contracts. The user can query the Blockchain Connected Gateway to check the device information or access the data provided by the device without connecting to the device directly.

4.2 Data Assurance

In addition to data privacy and access, data integrity and reliability also require our attention. An IoT system keeps sensing and generating large volumes of data. Since most of the data is transmitted via untrusted channels, there are potential risks of data tampering and data loss during the transmission. From the storage perspective, when the data is accumulated in the central database, it is a critical and severe problem to ensure the integrity and freshness of the data. We believe that blockchain is an appropriate technique to address the data provenance and data integrity problems. The hash function—based blockchain systems inherently address data integrity. They also provide the timestamp as a useful freshness reference.

Different researchers are already working on addressing data security issues using blockchain. Liang et al. [127] in-

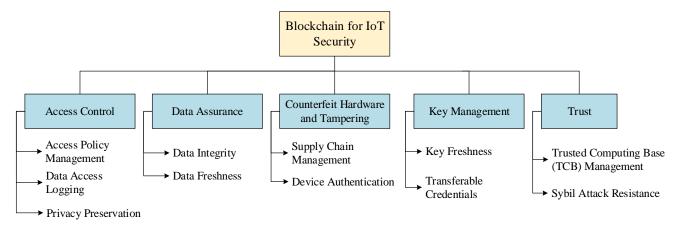


Fig. 5 Blockchain for IoT Security

troduced a blockchain-based data assurance system for drones. The system consists of four components: drone, control system, blockchain network, and cloud server. The drone collects image or video data and receives commands from the control system. The cloud server logs the command records sent by the control system and stores the raw data in a database. The blockchain stores the hashed data records to provide data integrity and generates receipts for data validations. The implementation of a blockchain network in the proposed system is based on Tierion and Chainpoint [7]. As briefly mentioned in Section 3, blockchain-based IoT data storage systems can always provide additional and reliable data protection. Another similar example is [132], which also used blockchain to perform data verification and assure data integrity. They used blockchain to store the hashes of uploaded data and established and evaluated a proof-of-concept system based on Ethereum and InterPlanetary File System (IPFS) protocol [36]. To ensure the time synchronization of IoT services, and guarantee the freshness and reliability of data, a blockchain based time synchronization method is proposed in [72], where, an IoT node could verify and synchronize the time by reading the time consensus result in the blockchain.

4.3 Counterfeit Hardware

The continuous growth of counterfeit electronics devices poses a serious threat to critical IoT infrastructures due to their inferior quality and has become one of the major concerns of the government and industry [89,90,186]. Most low-cost edge devices are manufactured in limited-trust environments lacking relevant government regulations (e.g., to curtail counterfeiting and infiltration of threats at manufacture), move through supply chains without strong controls, and then are deployed in critical infrastructures worldwide. Attacks on the IoT system can originate from untrusted hardware by exploiting existing communication protocols and network traffic. Hardware attacks against a system can occur with

physical tampering of a device and/or by the introduction of a counterfeit device [21,54,55,185,186] into the system.

The detailed descriptions for counterfeit ICs can be found in [89, 90, 186]. However, we consider devices rather than ICs for IoT perspective. Counterfeit devices can be described as non-authentic devices. These fake devices can be manufactured with inferior quality parts, those can be reclaimed from discarded electronics. In addition, an adversary can produce devices with the bill-of-materials similar to the authentic ones. An adversary can also tamper the device to create a backdoor, which can be used for malicious purposes. Counterfeit IoT devices could be potentially installed with a malware, or even controlled by adversary as a bot. According to Nokia Threat Intelligence Report, 78% of malware activities in 2018 are driven by IoT botnets [5]. The first Mirai malware based IoT botnet DDoS attack took down hundreds of web services for hours (including Github, Twitter, Netflix, etc.). These attacks not only damaged the targeted services but also effected the IoT devices owners - the attack on Krebs costed the devices' owners approximately \$320,000 on excess power and bandwidth consumption [15].

The detection of counterfeit electronics in the IoT infrastructure manifests a variety of challenges. It is difficult to detect whether devices or appliances have been tampered with. It is also hard to imagine how the user can know and detect an eavesdropping microphone embedded in a smart bulb or smart television. For an IoT infrastructure, an untrusted employee may also try to tamper with some devices for his or her own benefit. Moreover, for IoT devices that have high mobility like drones, if the protection cannot fully cover all regions of travel, then the devices would have higher potential risk of being tampered with. Even a verification mechanism is provided, it is hard to keep verifying a large amount of devices in a regular interval.

To solve the mentioned challenges, Guin *et al.* [88] introduces a blockchain-based framework to prevent and detect hardware counterfeit and tampering. The proposed framework has four main components: physically unclonable func-

tions (PUF) [81, 85, 177], global blockchain, local blockchain, and a secure communication protocol [91]. An SRAM PUF [85, 195] is used as the device identity generator that can generate unique strings for each device. A global identity blockchain is used for manufacturers of edge devices to register their devices. Once a device is registered, anyone can globally access its identity. Blockchain eliminates the need of central or local database for storing device IDs, which helps to solve the single point of failure problem. The inherent immutability feature of blockchain ensures the data integrity, and also prevents the adversaries from tampering the data records. However, if a system is built upon traditional centralized database, all the data records could be altered and effected once the database is compromised. In addition, the distributors and customers can directly verify the device using the blockchain without querying the specific manufacturer's database.

The system proposed in [88] needs manufacturers to upload a cryptographic hash of the ID from PUF into the global blockchain such that an entity in the supply chain can verify the true identity of a device. However, it is required to authenticate every device in a regular interval when an IoT device (edge nodes) is deployed in the field. This prevents an adversary (e.g., a rogue or a compromised employee) put a counterfeit device into the IoT infrastructure. The communication between the gateway and edge node has to be very low cost. To provide that support a low-cost communication protocol [91] is used, which uses a secret key for transferring the PUF response to the gateway to verify the identity of the edge node in the field. Note that this secret key can also be generated from the PUF. A local blockchain contains the hash of device ID for identity verification.

Authenticity is not the only benefit of using blockchain, Islam *et al.* proposed a method that uses PUF and blockchain to enhance authenticity and traceability in the supply chain [107]. All the electronic parts or IoT devices can be registered, managed, and protected by a blockchain. Origin manufacturer, current and previous owners, and all the traces in supply chain can be recorded in the blockchain. This detailed information helps the customer to make their inference on the authenticity and reliability of IoT devices.

4.4 Key Management

With the expanding scale of IoT systems, key management becomes extremely challenging and requires immediate solution. For some applications, it may not be feasible to upgrade an IoT device to enhance security once it has been deployed. The key used for encryption, if present, needs to be refreshed securely to address long-term security. Blockchain can be used to address key management issues that the current IoT systems are suffering.

We have already mentioned in Section 3.7 that a key management framework for vehicular network using blockchain is proposed in [119]. In addition, multiple blockchains are used in [155] to provide a decentralized access control system for IoT networks. These blockchains are separately used to store public credentials, network contextual information, events logs, and access rules. The particular blockchain responsible for key management is the relationship blockchain, which maintains the credentials like keys and IDs, and also records the relationships among entities in the system. An authorized internal member could be registered on the chain only by storing a simple identity into the blockchain. However, an external member would need to upload the public key for that purpose. Another work from Kravitzet al. [113] proposed permissioned blockchain to provide rotatable and transferable key management for IoT system. A user could use, update, and manage the keys in one or a group of devices.

4.5 Trust

An adversary can easily disrupt the trust in the IoT system by spoofing or forging identities. For instance, the Sybil Attack [66] is based on interference with system reputation: one could register a large number of nodes to affect the consensus or the reputation of the entire system. Blockchain is a suitable solution for the trust management, as already proven by the PoW mechanism in Bitcoin; by increasing the cost of participation, trust is achievable. However, trust of nodes or peers is not the only concerning factor. Even when all devices are benign and trusted, the user still needs to determine whether data from the authenticated devices is always trustworthy.

Some trust management schemes rely on the concept of the Trusted Computing Base (TCB) [99], which is widely used as a baseline to ensure an environment and all data from that environment are trustworthy. In [152], the reliability of the sensed data from IoT devices is addressed by combining the ARM TrustZone [6] with blockchain. Running the blockchain node inside the trust zone of a chip can achieve remote attestation and management of TCB. Asiri et al. [27] introduced a Sybil attack-resistant IoT trust model that uses blockchain. In this model, the trust problem of the local system can be addressed by using the Chaincode and endorsement policy of HyperLedger Fabric. The underlying concept is simple: some of nodes in the blockchain network work as the blockchain CA to validate and evaluate the trust of the system instead of involving a third party CA. Hammi et al. [95] proposed to create bubbles (groups) in IoT infrastructure, and register all the bubbles and bubble members in blockchain. Therefore, all the communication and data in the bubbles are protected and trusted, and all the communication attempts from outside the bubble are blocked.

As most of the IoT infrastructures rely on a central management system, which is generally maintained by third parties, the trust of services provided by them always remains one's concern. A decentralized blockchain based framework is proposed to replace the third party data management authority in IoT infrastructures [30]. With the help of blockchain and Intel SGX hardware, a local trusted execution environment can be established, which could further replace and outperform a third party data processing service [30]. Similarly, a blockchain-based nonreputation service scheme for IoT is described in [202], where the blockchain works as a service publisher and event recorder. In addition, Ma *et al.* introduced a blockchain based key management system for IoT infrastructure, where the central key generation center can be eliminated and the trust can be preserved [135].

On the other hand, the trust of all the participants along with the third party service providers in the IoT infrastructures can be managed by blockchain as well. Zhang *et al.* proposed a blockchain-based smart manufacturing system, which aims to reduce the "trust tax" paid by the participants [208]. Blockchain enables the transparent data management in the manufacturing and distribution procedure, the manufacturer, distributor, customer, stakeholder, and government could all get benefits. A similar idea of ensuring trust among IoT participants via blockchain is demonstrated in [181].

As long as a IoT service is publicly accessible and centrally managed, trust will always remains an inevitable issue. The operations and behaviors of infrastructure owners, data producers, and data buyers need to be regulated in a reliable and traceable manner. The access to data, use of devices, and payments to services need to be secure and auditable. It has been proved that blockchain could be an ideal option to provide secure trust management in IoT infrastructures. The further development and investigation of blockchain in IoT applications have far prospect.

5 Challenges and Limitations

As a result of the rise of cryptocurrency, investigation into uses of blockchain beyond cryptocurrency has become an attractive focus for both industry and academia. A number of blockchain applications in IoT have also been implemented and discussed in both academia and industry, and some of the examples are already introduced in Section 3. Though the blockchain could enhance and refine various aspects of IoT, the design and implementation of blockchain is in the nascent phase. Besides the benefits that IoT could gain from blockchain, it is very relevant to address a series of underlying challenges and limitations. In this section, we focus on discussing the challenges of using blockchain in the IoT perspective. We present a discussion on the applicability and necessity of using blockchain in IoT scenario, followed by the analysis of the cost of implementing blockchain in IoT.

Then we discuss the throughput and latency limitations of the blockchain as well as the on-chain privacy and security problems. In addition, we discuss the maintenance and regulation of blockchain-based services.

5.1 Applicability and Necessity

For some application domains, blockchain is an ingenious and practical complement for both data management and security. But not all the services and scenarios require the adoption of blockchain, and it is inadvisable and unnecessary to insist on using blockchain. To determine whether an application must involve blockchain, the following should be considered:

- Trust among entities: If all participants of the IoT network trust each other or the IoT service is acceptable for a trusted central authority, then the need for blockchain is dramatically decreased.
- Need for data sharing: Besides the trust of the system, if the data itself does not have to be shared among the entities, e.g., the data is private, even the hash of the data or the number of data entries is not allowed to be shared. Then the introduction of blockchain in IoT is not significant. In addition, blockchain is suitable and useful in data sharing when the data owners need a common platform for such a purpose, meanwhile, the data itself and the data sharing procedure cannot be controlled by one or a group of entities. For example, one needs to share the data with other nodes in the network but each time only wants to share it with only one receiver where it is not allowed to expose the data to any third party.
- Implementation cost: A limitation of using blockchain as a data platform for IoT is the cost of data storage in the chain. IoT generates huge amount of data, so one should primarily consider two cost factors- (i) Data storage cost: If the data needs to be uploaded and shared through a public chain, it is necessary to consider cost per data byte and whether it is worth storing a large volume of data in the blockchain. However, if the blockchain is only used for storing the policies and identities, the cost should be affordable, and (ii) Data protection cost: Transparency is a main advantage of blockchain; however, when it turns to data storage, transparency could be a drawback. If the aim is to provide privacy in a transparent chain, the data stored in the chain may need to be hashed or encrypted. As a consequence, the size of the stored data could increase, especially for the sensor data. For instance, a temperature sensor generates raw data points a few bytes in length (e.g., $25^{\circ}C$). However, after the SHA-3-256 hashing, the data becomes 32 bytes long. The additional storage cost can be neglected when

the frequency of data upload is low or the overall data amount is limited.

5.2 Implementation Cost

Generally, blockchain is not a lightweight solution. The PoW mining procedure is especially resource intensive, since it requires miners to continuously perform hashing to add a block in the chain. Even for a resource-sufficient device like a desktop computer, efficient mining requires certain hardware resources. Thus, it is not yet practical to involve mining into resource-constrained devices in an IoT system. For the PoW-based blockchain applications in the IoT, the edge device at most can work as the simple blockchain node, which can only receive data blocks and initiate new transactions. One needs to use separate resource-sufficient devices to mine for the blockchain network. Another situation is more severe: the IoT device cannot even afford the overhead of running as a simple node because the processor power or the memory size limits the constraint device to run a blockchain client and join the blockchain network. In this case, an agent or gateway device is required to receive, relay, and upload the data. An example of the scenario is described in [148]. The resource limitation actually decouples the blockchain layer with the IoT layer and makes those miners in the blockchain become the local central authorities. This decoupling is clearly a violation of the original intention for using blockchain.

5.3 Throughput and Latency

The block generation and transaction processing speed of the blockchain increase the latency and impede the throughput of a system that uses blockchain. This problem becomes more severe for the IoT scheme, since the blockchain system takes time to achieve a consensus, even for a small IoT infrastructure with a limited transaction rate. The system needs a certain amount of time to append the new data into the blockchain, and this minimum latency cannot be eliminated. The default block generation time of Bitcoin is around 10 minutes, and Ethereum's is around 17 seconds. For some other services, this latency is intolerable and it is necessary to find a way to further reduce the block generation interval [71]. A scaled IoT system requires a platform that can handle thousands of transactions every second. However, the traditional design of a blockchain system, such as Bitcoin, can only support 3-7 transactions per second. With some modification and optimization of the original design, Ethereum can still only process 20 transactions per second. The throughput of such blockchain design cannot fulfill IoT requirements.

5.4 On-Chain Privacy and Security

As stated previously, when we enjoy the benefits provided by blockchain, a reliable method to preserve privacy is needed as well. Note that blockchain is suitable for providing privacy and security for IoT applications, but it does not mean the blockchain itself does not face any privacy and security challenges. On-chain privacy is still an ongoing research problem. One of the most notable methods is the Zero-Knowledge Proofs (ZKP), which allows peers to authenticate one other or verify a statement without revealing the identity [35]. ZeroCash is a cryptocurrency built upon the ZKP [163], and Hawk [112] is a ZKP-based framework that provides privacy-preserved smart contracts. These two implementations also demonstrate the feasibility of using ZKP to achieve privacy in blockchain systems.

When it comes to blockchain applications in IoT, security issues are a different story. First, the practical ZKP scheme divides into two types: either it requires multiple interactions between two peers or it relies on a trusted setup of common reference strings (CRS) on both peers. Using an interactive model requires multiple times of communications for proving and verifying, which also provide additional and unaffordable traffic overhead for constrained devices. The detailed overhead of enabling ZKP is yet to be evaluated. There is also an issue with the difficulty of securely predeploying the CRS in thousands of different types of IoT devices. Second, the proving and verifying procedure of ZKP are resource intensive and time consuming [112].

It is promising to incorporate zero-knowledge proof (ZKP) to improve the privacy of blockchain instances. However, the integration of ZKP-based blockchain in IoT still remains challenging and is in its infancy. Hardjono *et al.* introduces a conceptual ZKP-based blockchain system to securely and anonymously commission IoT devices into cloud [98], but the real implementation of ZKP-based blockchain in IoT is estimate to complete. Another ZKP-based blockchain system is described in [86], which aims to ensure the reliable energy consumption records in smart grid. However, the ZKP used in this system is more like a ring signature, and it requires an user to register multiple pseudonyms (keys) to hide their real identities. Each authentication procedure needs to be associated with a pseudonym (key).

Homomorphic computation could be another potential choice to further solve the on-chain data privacy problem. An example is described in [214] as Beekeeper system. In the proposed Beekeeper, the encrypted data sent by IoT devices can be processed by other members of the blockchain (servers) without decrypting the data. However, the processing and operation on the data are still limited to simple addition and multiplication. A similar experimental use of additive homomorphic encryption (only supports addition) is shown in [172]. Note that, ZKP mainly provides privacy of

user credentials and identities, while homomorphic computation in Beekeeper focuses on data privacy. Hashing and encryption of data provide a baseline data privacy in blockchain, but ensuring privacy during data processing needs further investigation.

Smart contract security is another major concern of blockchain applications. Most of the novel capabilities provided by blockchain applications need the support of smart contracts, and the security of smart contract has its own challenges. Ethereum, as one of the most popular smart contract platform, has smart contract issues such as vulnerability of smart contract coding, like the example in DAO [8], which utilizes the unchecked fallback functions. Another type of vulnerability is to play with the gas mechanism (transaction fee) in Ethereum. For instance, an issue has been found in King of the Ether Throne [12]: by only including a small amount of gas in a refund transaction, the transaction could be intentionally failed. In addition, keep storing data in an array in the smart contract may continuously increase the gas cost of the contract operations related to this array. At a certain point, because of the huge gas cost, the array cannot be altered anymore. Some other details and examples of the vulnerabilities are demonstrated in [28].

5.5 Maintenance and Regulation

The blockchain application owner needs to consider the drawbacks of anonymity. If the service is not running on the permissioned scheme and the user has the access to the blockchain, it may lead to some potential risks. Since a user maintains a secret identity in the blockchain, interacting with unknown peers faces legal obligations and reputation risks.

Immutability is also a double-edged sword of blockchain. As the blockchain is a tamper-resistant system such that each block appended into the chain is immutable, one could not modify, replace, or discard an appended block on the chain. However, it is needed to correct mistakes and exceptions inside a system. A block may contain an appropriate transaction with a huge amount of money sent to a wrong receiver, a smart contract with flaws can be published, and incorrect data entries may be uploaded into the contract. For a traditional system that uses databases, these problems can be fixed easily. But reversing the data stored in the blockchain may require careful consideration, supervising, and a certain amount of payment (hard fork a blockchain to reverse mistakes [141]). Although Ethereum allows republishing of a smart contract or removing some contents stored in the contract, it also introduces some further concerns, e.g., the security of the system relies on the reliability of the contract

Another issue that has been less frequently discussed is the termination of blockchain services. Unlike a traditional service, the service vanishes after shutting down the server and removing the database. A blockchain is a collaborative recording system that starts within a same genesis block. Even if the service provider decides to stop the operations, one could still continuously work on this chain for one's own purpose. One could fake the original service or run it for some illegitimate uses.

For the IoT perspective, maintenance of blockchain services encounters additional security challenges. Since most of IoT devices are resource-constraint, most of them cannot work as a full blockchain node. Namely, the computational mining power is usually separately configured or even outsourced. The outsourced mining pool manager for a large scale blockchain-based IoT services could decide to hop to other mining tasks for more mining rewards, this situation is described as "coin hopping attack" [215]. When such attack occurs, the victim service would be halted due to lack of mining power, and those smart devices typically lack the ability to sense a pool managers behavior due to the limitation of computational power [215].

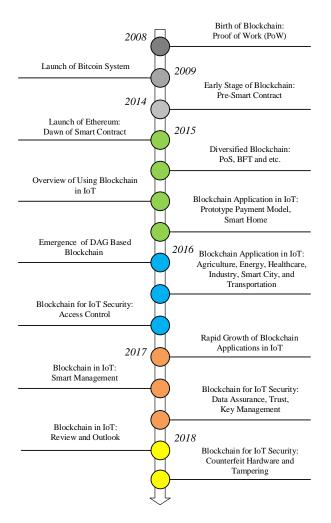


Fig. 6 Timeline of Blockchain and Blockchain in IoT

6 BIoT Research Roadmap

Hundreds of blockchain-related papers have been published in conference proceedings, journals, or magazines in the last decade, and the rate and number of publications maintains a rapid growth due to the promising future of blockchain. Blockchain in IoT is a subsection of the blockchain research domains that also get extensive attention in the research community. In this section we present and analyze the overall status of blockchain usage in IoT.

A variety of researches and applications prove the feasibility and practicability of using blockchain in IoT. However, as described in Section 5, there are still several challenges that need to be addressed, some problems require solutions, and some implementations and designs of the application can further be refined. Currently, we are just at the beginning of a long journey of blockchain in IoT research. Although the prospect is bright, the future directions need to be discussed and analyzed. Further optimization and adoption of blockchain is urgently needed to make the blockchain more suitable and available for IoT systems. In addition, a detailed and comprehensive measurement of the application in a practical and scaled system has never been performed even though some of the concepts and prototypes of blockchain applications in IoT are proposed, introduced, and implemented. Moving forward one more step, the potential of joint points in other scenarios also need to be analyzed despite blockchain already being applied in a few IoT application domains. In this section, we also briefly introduce the roadmap of blockchain in IoT research with regard to all the aspects mentioned above.

6.1 Research Trend

To present an overview of the blockchain and blockchain in IoT research, we show a timeline in Figure 6. In 2015, seven years after Satoshi Nakamoto introduced blockchain, favor toward and investigation of using blockchain in IoT increased. Although there were a few works that mention the convergence of blockchain and IoT between 2008 and 2015, the fusion was just demonstrated in a general view without specific and practical implementation. The real revolutionary technique that triggered the development of blockchain applications in IoT was the smart contract, and the practical smart contract platform was launched by Ethereum in 2015. After several initial attempts to use blockchain in IoT in 2015, there is an increasing research trend. In this paper, we surveyed 97 blockchain in IoT papers since 2015, and the publication trend is described in Figure 7. It is shown the publication number is expected to keep rising in coming years.

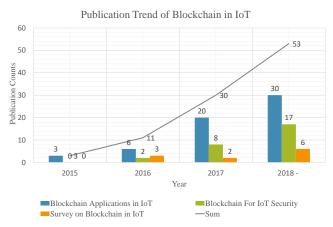


Fig. 7 Trend of Blockchain Research in IoT

6.2 Optimization and Adoption of Blockchain

Before blockchain can be adopted into IoT and before an IoT-oriented blockchain application can be implemented, the blockchain has to overcome the limitations of resource intensity and throughput bottleneck. Resource and energy intensity are mainly incurred by the difficulty of reaching consensus. Most of the current blockchain applications in IoT use PoW consensus mechanism; as the original and representative consensus algorithm, PoW is supported by a variety of blockchain systems. It is also reasonable to select PoW as the first option to implement a blockchain application in IoT. However, prevalence and popularity do not indicate that an option can be suitable. A few other consensus algorithms like PoS and BFT are also competitive, but they are less investigated in IoT applications.

PoS and BFT-based blockchains have better scalability and efficiency compared to the traditional PoW-based blockchain instances [24, 136, 193]. The overall system throughput and latency are proved to be significantly improved as well. In addition, PoS and BFT require less computational resources as there is no need for hash computations as a part of proof-of-work. The overall energy consumption per transaction in Bitcoin system is around 620KWh (power consumed by all the active clients), whereas Ethereum uses around 27KWh [2, 3]. Even for the most resource intensive consensus algorithms, the power consumption could be optimized and deducted. While running blockchain clients with same test benchmark on Raspberry Pi, the power consumption per client of Hyperledger is only half of Ethererum client [162]. It is reasonable and promising to adopt lightweight consensus algorithm in IoT scenarios. Currently, research is ongoing to develop lightweight consensus algorithms.

Instead of using the current algorithms, developing a new and appropriate algorithm could be more suitable for a specific IoT application. Some of the researchers mentioned or performed the design of lightweight algorithms for IoT scenarios [64,88]; however, the implementation and analysis of

such algorithms are yet to be performed. It is worth mentioning that the essential goal of the consensus algorithm in blockchain is to provide a secure and random selection mechanism, which also ensures the selected participant can be verified and accepted by the whole network. Some of the researchers mentioned that the Verifiable Random Function (VRF) [140] is an ideal match for the blockchain consensus problem, and several VRF-based blockchain architectures also emerged [58, 82]. Basically, VRF is a pseudo-random function that can be used in the blockchain to randomly select users in a private and non-interactive way [62,82]. VRFbased blockchain attracts incredible public interest, which is also a proof of its potential. A notable example is the Cardano, which launched in October 2017 but has already climbed into the top 10 cryptocurrency list [4]. Elaborate introduction and description of VRF are out of the scope of this paper, but using VRF-based blockchain in IoT is an undiscovered and interesting path.

On the other hand, the blockchain structure itself suffers from the overall system performance. The traditional linked-list-based structure is restricted by the block size and block generation interval problems, and it is worth investigating the use of a different blockchain structure. As introduced in Section 2, IOTA uses a DAG-based architecture, and some other DAG-based blockchains are described in Meshcash [37] and SPECTRE [176]. A DAG-based blockchain allows parallel and concurrent block appending, which significantly enhance the throughput and latency of the system [37, 82, 176]. If a DAG-based blockchain architecture can be adopted into IoT, the overall performance and scalability can be improved. Thus, developing and adopting the DAG-based blockchain (or blockchain with other structures) within an IoT scheme could be a noteworthy future direction. An experimental DAG-based blockchain for industrial IoT is implemented in [100]. The main purpose is to create a credit (reputation) system for IoT devices over blockchain. In addition, sidechain [32] is another solution of improving the efficiency of blockchain systems. Vara et al. [45] utilize the feature of sidechain to achieve an improved efficiency in IoT-blockchain management, where sidechains are created along with the main blockchain to store IoT data. All the sidechain data are appended into main chain via a blockchain queuing system.

In addition, some of the other characteristics of blockchain can be further refined for the IoT scenario. The CAP theorem states that a distributed system cannot achieve consistency, availability, and partition tolerance at the same time [43]. Generally, blockchain gives up short-term consistency to achieve global availability and partition tolerance. Although the whole network will finally see the same public ledger, each node may have a different view of the public ledger at a particular time. This problem may be enlarged in the IoT scheme since IoT devices may not be active and online all the time due to the energy saving or limited channel access. When IoT devices participate in a blockchain network, the sleep period may cause an inconsistency between the device local blockchain and the global blockchain. It would be an interesting topic to accelerate the procedure of updating the local blockchain to a global one. Especially for the IoT applications, this procedure cannot be resource intensive or involve heavy communications. A trial example related to this topic is performed in [56]. In addition, lightweight synchronization protocol and lightweight blockchain client for IoT are implemented in [57]. In the proposed approach, an aggregation scheme is defined to reduce the duty cycle of device, and the overall communication cost is reduced as well.

6.3 Blockchain-Oriented System

The integration of blockchain and IoT is still facing challenges due to the fact that running blockchain is power and resource intensive, whereas IoT devices are normally resource constraint. The optimization of blockchain in IoT does not only limited to the protocol establishment and software implementation, but also refers to an all-sided hardware and system support. The design of blockchain-oriented hardware, the implementation of blockchain-oriented operating system and platform also need to be taken into account. Blockchain oriented hardware that focuses on blockchain operations could further promote seamless integration of blockchain and IoT. This is promising and practical. IBM recently introduced a CPU capable of running blockchain operations, which is smaller than a grain of salt and costs only 10 cents [11]. This tiny computer can monitor, analyze, communicate, and act on data. It could be embedded and integrated into IoT hardware to provide additional, efficient, and reliable support for blockchain operations.

Running blockchain on IoT device is confronted with some other limitations. Since the hardware architecture of IoT devices are different with normal computers and servers. Not all the up-to-date blockchain implementations can be directly deployed on IoT devices. For example, maintaining and developing blockchain for ARM based hardware system are still insufficient. In addition, implementation of blockchain oriented firmware or operating system for IoT devices is also necessary. The simplification and conduction of redundant functionality, the optimization and customization of system design could potentially help the integration of blockchain and IoT. Some pioneers have already started the investigation of blockchain-oriented IoT operating system [197].

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6.4 Measurement and Practical Proofs

In the early stages of technology development, the technology always lacks measurement and proofs. For the blockchain applications proposed in the IoT paradigm, it is difficult to tell the amount of overhead from the introduced solution. The memory usage, CPU utilization, and energy consumption of the blockchain architecture remain uncertain. Even when a prototype system is built up, the baseline of hardware and resource requirements are always unclear. Meanwhile, though some of the works analyze the throughput and latency of using blockchain in IoT [94, 97, 194], the measurement of performance ceilings and comparisons with other methods are still open. Furthermore, the measurement and proof of the availability, consistency, scalability, stability, and security within a long-term living practical system also require our attention. Further investigation of detailed measurements and proofs may give other researchers a better overview and guidelines.

6.5 Potential Application Domains

The current research on using blockchain in IoT already covers the majority of the application domains, and here we briefly introduce a few other potential application domains that may be of interest:

- Smart Retail: IoT can contribute to smart inventory management with refined accuracy and improved efficiency [105]. IoT solutions not only provide data collection and data connection between the Point of Sale (PoS) system and the inventory system but also allow the customer to use their mobile devices to check and locate the inventory. In addition, introducing blockchain into the retail scheme may create another revolution. Besides the logistic and supply chain management benefits it provides, blockchain can enable direct selling as well. Since the provenance, manufacturing, distribution, and sale are all recorded by the blockchain, it is possible for the producer and customer of a product to establish a precise and private retail channel.
- Smart Education: Along with the development of IoT, education is also evolving at a very accelerated rate. By using smartphones, tablets, and computers, course schedules, homework assignments, and examination grading are moving in an efficient and paperless direction. Furthermore, students' behavior, learning habits, and knowledge mastery can be further collected, tracked, and analyzed by using IoT smart terminal devices, which enable custom and elaborate smart education. Adding blockchain into the smart education scenario is also reasonable, as blockchain can introduce additional transparency and fairness in education resource sharing, assignment

- grading, and course evaluation. Especially, blockchain can also contribute to certificate management in the education system.
- Environment Monitoring and Disaster Prevention: There are several difficulties and drawbacks to deploying manpower for environment monitoring. First, it is difficult and expensive to cover a large area. Monitoring a entire piece of forest with only a few individuals is not practical and efficient. Second, it is hard for the individuals to consistently monitor the environment all year long. Third, the monitoring of dangerous or tough environment zones like snowy mountains, volcanoes, and deserts cause challenges. Thus, it is reasonable to use the IoT to achieve available and consistent monitoring in such environments. On the other hand, information integration, analysis of information correlation, and collection of individual reports are needed in a disaster prevention paradigm. Blockchain may help in long-term environmental data management and sharing.

7 Conclusion

The Internet of Things (IoT) and blockchain are two of the most promising technologies in this decade. The convergence of these two technologies is absolutely necessary and requires our attention and investigation. In this paper, we illustrated the decentralized, transparent, and tamper-resistant features of blockchain, which can enhance the data management, service management, device management, and security of IoT. We summarized the blockchain applications used to refine IoT system performance and security within the agriculture, energy, healthcare, industry, smart city, smart home, and transportation domains. We then briefly analyzed and discussed the limitations of using blockchain in an IoT environment. We also presented the current research trends of and a future roadmap for blockchain in the IoT applications to provide a baseline guideline for adoption.

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